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Macrophage migrating inhibitory factor expression is associated with *Trypanosoma brucei gambiense* infection and is controlled by trans-acting expression quantitative trait loci in the Guinean population

Justin Windingoudi Kaboré¹, Oumou Camara², Hamidou Ilboudo³, Paul Capewell⁴, Caroline Clucas⁴, Anneli Cooper⁴, Jacques Kaboré^{1,5}, Mamadou Camara², Vincent Jamonneau⁶, Christiane Hertz-Fowler⁷, Adrien Marie Gaston Bélem⁵, Enock Matovu⁸, Annette Macleod⁴, Issa Sidibé¹, Harry Noyes^{9¶} and Bruno Bucheton^{2,6*¶}, For the TrypanoGEN Research Group, as member of the H3Africa Consortium.

¹Centre International de Recherche-Développement sur l'Élevage en zone Subhumide (CIRDES), Unité des Maladies à Vecteurs et Biodiversités (UMaVeB), Bobo-Dioulasso, Burkina Faso; ²Ministère de la Santé et de l'Hygiène Publique, Programme National de Lutte contre la Trypanosomiase Humaine Africaine (PNLTHA), Conakry, Guinée; ³Institut de Recherche en Sciences de la Santé (IRSS), Unité de Recherche Clinique de Nanoro (URCN), Nanoro, Burkina Faso; ⁴University of Glasgow, Wellcome Trust Centre for Molecular Parasitology, Glasgow, United Kingdom; ⁵Université Nazi Boni (UNB), Bobo-Dioulasso, Burkina Faso; ⁶Institut de Recherche pour le Développement (IRD), UMR IRD-CIRAD 177 INTERTRYP, Montpellier, France; ⁷University of Liverpool, Institute of Integrative Biology, Liverpool, United Kingdom; ⁸Makerere University, College of Veterinary Medicine Animal Resources and Biosecurity, Kampala, Uganda; ⁹University of Liverpool, Centre for Genomic Research, Liverpool, United Kingdom.

* Corresponding author

E-mail: bruno.bucheton@ird.fr

¶ These authors contributed equally to this work.

Abstract

Infection by *Trypanosoma brucei gambiense* is characterized by a wide array of clinical outcomes, ranging from asymptomatic to acute disease and even spontaneous cure. In this study, we investigated the association between macrophage migrating inhibitory factor (*MIF*), an important pro-inflammatory cytokine that plays a central role in both innate and acquired immunity, and disease outcome during *T. b. gambiense* infection. A comparative expression analysis of patients, individuals with latent infection and controls found that *MIF* had significantly higher expression in patients ($n = 141$; 1.25 ± 0.07 ; $p < 0.0001$) and latent infections ($n = 25$; 1.23 ± 0.13 ; $p = 0.0005$) relative to controls ($n = 46$; 0.94 ± 0.11). Furthermore, expression decreased significantly after treatment (patients before treatment $n = 33$; 1.40 ± 0.18 versus patients after treatment $n = 33$; 0.99 ± 0.10 , $p = 0.0001$). We conducted a genome wide eQTL analysis on 29 controls, 128 cases and 15 latently infected individuals for whom expression and genotype data were both available. Four loci, including one containing the chemokine CXCL13, were found to associate with *MIF* expression. Genes at these loci are candidate regulators of increased expression of *MIF* after infection. Our study is the first data demonstrating that *MIF* expression is elevated in *T. b. gambiense*-infected human hosts but does not appear to contribute to pathology.

1. Introduction

Found in sub-Saharan countries, human African trypanosomiasis (HAT), or sleeping sickness, is a neglected tropical disease. It is caused by *Trypanosoma brucei gambiense* in western and central Africa, and *T. b. rhodesiense* in eastern Africa. The two forms of the disease are considered lethal without treatment and both are transmitted by tsetse flies of the genus *Glossina* (order *Diptera*) (Buscher et al., 2017; Simarro et al., 2010). *T. b. gambiense* causes 97% of all HAT cases and is classically described as a chronic disease with an early haemolymphatic phase (stage 1) characterized by non-specific signs. This is followed by a meningoencephalitic phase (stage 2) in which the parasites penetrate the blood brain barrier, leading to neurological disorders and more specific signs characterised by sleep disorder from which the name sleeping sickness is derived, consists of daytime somnolence and sudden overwhelming sleep urges, and nocturnal insomnia (Buscher et al., 2017; Checchi et al., 2008). However, findings show that *T. b. gambiense* infection can lead to a wide array of clinical outcomes, ranging from acute disease that progresses rapidly to the second stage (Garcia et al., 2000; Truc et al., 1997) to spontaneous self-cures (Checchi et al., 2008; Jamonneau et al., 2012)

and even latent infections with very low blood parasitaemia that, in most cases, are not detectable by microscopy. Long-term follow up has shown that this latter type of latent infection may persist for several years (Jamonneau et al., 2012).

The pathogenesis of *T. b. gambiense* HAT is poorly understood as disease development is dependent on the host immune response, the genetic variability of the parasites and the host-parasite interactions (Garcia et al., 2006). To address this, a candidate gene study was recently performed in Guinea to explore the association between genes involved in host immunity and the disease. This study found significant associations in the *APOL1* gene a component on the trypanosome lytic factor (TLF) that confers resistance to *T. b. brucei* infection and also with rs1818879 of interleukin-6 (*IL6*) (Kabore et al., 2017). Several suggestive associations were observed at the macrophage migration inhibitory factor (*MIF*) gene locus, although these did not remain significant after Bonferroni correction (Kabore et al., 2017). Although we did not observe significant genetic association at the *MIF* locus in our Guinean HAT cohort, *MIF* is nevertheless known as an important pro-inflammatory cytokine that plays a central role in the control of both innate and acquired immunity in a number of diseases (Calandra, 2003; Renner et al., 2005). Elevated serum levels of *MIF* have been found in patients with malaria (McDevitt et al., 2006), viral hepatitis (Kimura et al., 2006), HIV infection (Regis et al., 2010), rheumatoid arthritis (Morand et al., 2002), sepsis (Bozza et al., 2004), vasculopathy (Zernecke et al., 2008), and Chagas disease (Cutrullis et al., 2013). Importantly, it was also shown Stijlemans *et al.* showed that *MIF* mediates the pathogenic inflammatory immune response and increases the recruitment of inflammatory monocytes and neutrophils promoting the most prominent pathological features of experimental trypanosome infections (Stijlemans et al., 2014). Regarding *Trypanosoma cruzi*, *MIF* was also shown to play an important role in the host defence against acute infections, favouring the production of the pro-inflammatory cytokines during the early phase of infection (Reyes et al., 2006). These studies have prompted us to evaluate *MIF* expression in human *T. b. gambiense* infections.

To establish a potential role for *MIF* in determining *T. b. gambiense* clinical diversity, we examined *MIF* transcript expression in a Guinean cohort. For this study, *MIF* mRNA expression levels were determined by qPCR in HAT patients before and after treatment, individuals harbouring long term latent infections and endemic uninfected controls. In addition, the availability of genome wide SNP data generated within the framework of the TrypanoGEN network for some of these individuals (Ilboudo et al., 2017) made it possible to identify expression quantitative trait loci (eQTLs) potentially involved in the regulation of *MIF*

expression. The identification of these loci contributes to our understanding of how MIF expression is controlled and may have relevance to a wide range of infectious and immune-pathophysiological disease.

2. Materials and methods

2.1. Ethics statement

Samples were collected during medical surveys conducted by the national control program (NCP) of the Republic of Guinea according to the national HAT diagnostic procedures approved by the Ministry of Health in Guinea. All participants were informed of the objective of the study in their own language and signed an informed consent form. For participants less than 18 years of age, informed consent was obtained from their parents. Approval for this study was obtained from the « comité consultative de déontologie et d'éthique » (CCDE) of the « Institut de Recherche pour le Développement » (1-22/04/2013). This study is part of the TrypanoGEN project that aims to understand the genetic basis of human susceptibility to trypanosomiasis. Samples were archived in the TrypanoGen Biobank at CIRDES (Ilboudo et al., 2017).

2.2. Study population

All individuals participating in this study were identified during medical surveys performed between 2007 and 2011 by the NCP of the Republic of Guinea. Identification and sampling of study participants were performed in three active HAT foci (Forecariah, Dubreka and Boffa) located along the Guinean coast according to standard procedures describe previously (Ilboudo et al., 2011). For each participant, 5 ml of blood was taken in anticoagulant blood collection tubes to collect plasma samples and buffy coats for further DNA extraction. Two additional ml of blood were also taken with PAXgene Blood RNA tubes (PreAnalytiX). All samples were frozen in a portable freezer at -20°C in the field and were stored in the lab at -80°C. For all participants, the Card Agglutination Test for Trypanosomiasis (CATT) was performed. Direct microscopic examination of the buffy coat and/or the lymph node aspirate (if swollen lymph nodes were present) were performed if an individual was CATT positive, (Camara et al., 2010; Magnus et al., 1978). The immune trypanolysis test was performed at CIRDES on all plasma samples, as previously described (Jamonneau et al., 2010). For this study, 212 individuals were selected and three categories of phenotype were defined according to the following criteria:

i. Cases or HAT patients ($n=141$): Parasitologically confirmed patients, with CATT plasma dilution end titers $\geq 1/4$ and trypanolysis test (TL) positive. All HAT patients diagnosed within this study were treated according to the NCP procedures. Patients with HAT stage 1 disease (CSF white cell counts, ≤ 5) were treated by daily injection of pentamidine for 8 consecutive days. Early stage 2 patients (CSF white cell counts 6-20) were treated with one injection of pentamidine every 2 days for 20 days (10 total injections). Late stage 2 patients (CSF white cell count, > 20) were treated with three cycles of melarsoprol injections (one-third of the dose on the 1st day, two-thirds of the dose on the 2nd day and a full dose on days 3 and 4) administered 10 days apart. Of the 141 patients, 33 were sampled again 6 months after treatment at their first follow-up and were included in this study to examine *MIF* expression before and after treatment.

ii. Latent infections or Seropositive ($n=25$): individuals with CATT plasma dilution end titers $\geq 1/4$, TL positive, parasitology negative (no trypanosomes detected by mAECT and/or by examination of cervical lymph node aspirate when cervical adenopathies were present) and who maintained this phenotype for least two years.

iii. Endemic controls ($n=46$): Individuals with negative CATT results and negative TL, living in the same villages as a HAT patient and/or a seropositive subject. The age and gender characteristics of the different study groups is given in supplementary Table S1.

2.3. mRNA preparation and cDNA synthesis

Total mRNA from blood was extracted with the PAXgene Blood RNA kit (PreAnalytiX) and quantified with a NanoDrop spectrophotometer (NanoDrop Technologies). The mRNA quality was checked using the RNA Integrity Number (RIN) on an Agilent 2100 Bioanalyzer with the RNA 600 Nano LabChip (Agilent Technologies). Total mRNA was reverse transcribed according to the manufacturer's instructions, using High Capacity cDNA Reverse Transcription kit, Applied Biosystems and RNase inhibitor (Applied Biosystems) at a final concentration of 1.0 U/ml. The cDNAs were stored at -20°C and diluted to 1:5 with RNase-free water for use as a template in the real-time PCR analysis.

2.4. *MIF* expression assays by RT-qPCR

The real-time quantitative PCR analysis was conducted using the AriaMx machine (Agilent Technologies). All of the TaqMan RT-qPCR reagents, including the primers and probes, were

purchased from Applied Biosystems. The RT-qPCR analysis was conducted using predesigned and optimized Assays on Demand (Applied Biosystems). The following assays were used: MIF (ID: Hs00236988_g1) and TBP (ID: Hs00427621_m1). The reaction parameters were a 2min at 50°C hold and a 5min at 95°C hold, followed by 45 cycles of 15s at 95°C for a melting, and 1min at 60°C for annealing and extension. All of the measurements were performed in triplicate. A relative quantitation was conducted using *TBP* as a reference gene (Ledderose et al., 2011). The parameter cycle threshold (C_t) was defined as the cycle number at which the fluorescence intensity exceeds a fixed threshold. Relative amounts of mRNA for target genes were calculated using the comparative C_t method ($2^{-\Delta\Delta C_t}$). As the assays were optimized for PCR efficiency by the manufacturer, the mRNA-expression levels were estimated according to the delta- C_t values.

2.5. Genotype data

DNA was extracted from buffy coat (BC) samples using a Qiagen DNA extraction kit (QIAamp DNA Blood Midi Kit) following the manufacturer's instructions. DNA extracts were stored at -20°C. All DNA samples were quantified on a NanoDrop spectro-photometer, and shipped to Illumina, San Diego, California where they were genotyped on the H3Africa 2.5 million SNP chip. Genotypes were extracted from the Illumina genotype file and converted to Plink format using the H3ABioNet Nextflow topbottom.nf workflow in the H3ABioNet GWAS pipeline (<https://github.com/h3abionet/h3agwas>).

2.6. Statistical analysis

2.6.1. Differential Gene Expression analysis.

The $2^{-\Delta\Delta C_t}$ method was applied to determine gene expression levels for each individual (Livak and Schmittgen, 2001) and results used to compare the relative expression of *MIF* between HAT phenotypes. The Shapiro-Wilk test was initially used to test the null hypothesis (H_0) that the level of expression followed a normal distribution ($p\text{-value} > 0.05$). As *MIF* expression levels did not follow a normal distribution, we used the non-parametric Wilcoxon-test to perform the intergroup comparisons. This tested the H_0 that there was no difference in the mean expression of *MIF* between the phenotypes. We also used a paired Wilcoxon-test to compare *MIF* expression level in the same patient before and after treatment. Association of *MIF* expression with recorded covariates (gender, age, disease focus and HAT phenotypes) were analysed in univariate or multivariate linear regression. All of the data are presented as means \pm CI₉₅ and pairs of conditions and p -values < 0.05 were considered significant. All analyses were performed with R 3.4.4 software (R Development Core Team, 2018).

2.6.2. Expression QTL analysis.

A genome wide association study was undertaken in Plink to identify SNP associated with *MIF* expression levels. Quality control of the genotyped data was performed using Plink 1.9. Closely related samples were identified and one of each pair of close relatives were removed. We removed duplicate samples and samples with missing data > 5% and loci with minor allele frequencies < 5% and loci which were not in Hardy-Weinberg equilibrium ($p < 0.001$). We created a Plink phenotype file (Sample ID, sex, age, expression of *MIF*) containing 172 samples constituted of 29 controls, 128 cases and 15 individuals with latent infections for whom both expression and genotype data were available. We used linear regression in Plink 1.9 to perform eQTL analysis using the “linear” function, including the disease status as a covariate. Loci where significant eQTL were detected were reanalysed using a much denser set of SNP markers obtained by imputation from our genotype data and 1000 genomes reference data. Imputation was done by H3ABioNet at the University of Capetown using 1000 genome project genotypes as reference (Genomes Project et al., 2015).

3. Results

3.1. *MIF* expression in HAT patients, individuals with latent infections and endemic controls

MIF mRNA quantification was conducted on 212 samples that consisted of healthy endemic controls $n = 46$ (21.70%) and *T. b. gambiense*-infected individuals that were subdivided into two phenotypes: 1) patients with active HAT $n = 141$ (66.51%) of whom 33 (23.40%) were sampled again after treatment, and 2) individuals with latent infections $n = 25$ (11.79%) who tested positive in serology, but were negative upon microscopic examination and exhibited few or no symptoms. These individuals were followed for a period of at least two years and none developed detectable blood parasitaemia during their follow up despite remaining positive in serology. The sex ratio (male: female) of the study population was 1.41 (124/88) and the mean age (range) was 32.76 (5–85) years. Detailed characteristics of the study cohort are provided in Table S1.

MIF expression levels were assayed by RT-qPCR and compared between groups of individuals. As shown in Fig 1 and Table S2, *MIF* expression levels were found to be significantly elevated in patients (1.25 ± 0.07 ; $p < 0.0001$) and individuals with a latent infection (1.23 ± 0.13 ; $p = 0.0005$) when compared to controls (0.94 ± 0.11). In order to analyse further relation between *MIF* expression levels and infection by *T. b. gambiense*, we tested the effect of the recorded covariates (gender, age, disease focus and HAT phenotypes) and *MIF*

expression levels in a linear regression analysis (Table 1). No significant association of *MIF* expression with gender, age and disease focus was found in the univariate model ($p > 0.05$). In the multivariate model *MIF* expression was significantly associated to the infection status ($p < 0.0001$). No expression differences ($p = 0.809$) were observed between HAT cases (1.25 ± 0.07) and individuals with latent infections (1.23 ± 0.13) (Fig 1). These results suggest that *MIF* expression is induced during *T. b. gambiense* infection in humans but expression levels are not correlated with the clinical status. The *MIF* mean expression level decreased significantly in patients after treatment (1.40 ± 0.18 before treatment versus 0.99 ± 0.10 after treatment; $p = 0.0001$) and was similar to expression levels observed in controls (0.94 ± 0.11 ; $p = 0.255$).

3.2. Localisation of *MIF* expression quantitative trait loci

We next performed an eQTL analysis using our *MIF* expression data and genotype data available for a subset of samples to identify SNP loci that were associated with *MIF* expression. In all e-QTLs analysis of *MIF* expression, the infection status was included as a covariate in the regression analysis. Samples were genotyped on the H3Africa Illumina SNP chip that contains 2.5 million SNP loci and is enriched for common African SNPs. We found SNPs at four loci, located on chromosomes 1, 3, 4 and 10 respectively, that had significant associations with *MIF* expression ($p < 10^{-7}$) (Fig 2, Table 2). We did not observe any association signal on chromosome 22 at the *MIF* locus. SNPs were annotated with the closest gene(s) using Genome Reference Consortium Human Build 37 (GRCh37/hg19) data (Table 3). In particular, a locus containing chemokine (C-X-C motif) ligand 13 (*CXCL13*) was found to be significantly associated with *MIF* expression ($p = 7.12 \times 10^{-8}$). This chemokine is involved in many inflammatory responses, primarily involved in B cells. There was not information about the genes at the other eQTL loci to predict the mechanism of their effect on *MIF* expression (Table 2). Genetic association at these identified loci were then further explored by the mean of imputation to increase the number of SNPs in these chromosomal regions (Fig 2b, 2c, 2d, 2e). At each candidate loci, additional SNPs were found to be significantly associated with *MIF* expression levels thus supporting the genome wide association results (Table S3). A sharp peak of association was observed for the eQTL on chromosome 3 whereas association signals were broader for the eQTLs on chromosome 1, 4 and 10.

In order to assess the importance of *T. b. gambiense* infected individuals in the identification of *MIF* eQTLs, we repeated the analysis for the four identified regions on chromosomes 1, 3, 4 and 10 on several groups of individuals: all, HAT cases and controls and infected individuals only (HAT cases and latent infections). In all cases lower mean p-values

were obtained in the analysis excluding controls (Fig 3) although effect sizes were lower in this analysis. Most controls had low *MIF* expression levels and were thus probably not much informative in the analysis. This was particularly true for the e-QTLs on chromosomes 3 and 10 for which the strength of genetic association appears highly dependent of *T. b. gambiense* infected individuals.

4. Discussion

Although several studies have investigated the role of *MIF* polymorphisms rs36086171 and rs12483859 in HAT resistance/susceptibility (Ahouty et al., 2017; Kabore et al., 2017; Ofon et al., 2017), the present study is the first to look at *MIF* expression levels in a HAT endemic population containing individuals with latent infections. The principal finding was that, as observed for other infectious diseases, *MIF* expression is elevated during *T. b. gambiense* infection. However, levels did not correlate with disease severity as expression was found to be elevated in both HAT patients with active disease and individuals harbouring latent infections. A second major finding was the identification of four eQTLs involved in the control of *MIF* expression that may be relevant in wide array of disease settings. This demonstrates that studying humans infected with pathogens that stimulate an immune response may provide new insights into wider immune regulation mechanisms.

MIF is known to be a critical upstream mediator of innate immunity and is involved in a number of pathophysiological inflammatory processes such as glomerulonephritis (Yang et al., 1998) and asthma (Mizue et al., 2005). It is a pleiotropic cytokine produced by a variety of immune cells, including lymphocytes, macrophages and pituitary cells (Calandra et al., 1995). *MIF* expression is regulated by several factors, such as exposure to endotoxins, inflammatory cytokines and glucocorticoids, and exhibits a wide range of immune activities. This can include the induction of the Toll-like receptor 4 (*TLR4*) gene and the induction of inflammatory cytokines, such as *INFG*, *TNFA*, *IL8*, *IL6* or *IL12*. *MIF* is also known to sustain macrophage activation and the secretion of microbicidal molecules, including nitric oxide (Rosado and Rodriguez-Sosa, 2011).

Up-regulation of *MIF* expression has been reported for many infectious and parasitic diseases, demonstrating that *MIF* can play either a protective or deleterious role in the immune response to different pathogens (Rosado and Rodriguez-Sosa, 2011). For example, the *TLR4*-mediated response to *T. cruzi* has been reported as one of the main pathways involved in the early production of cytokines associated with human innate immunity during the acute stage

(Oliveira et al., 2004). Other studies have shown that MIF secreted by activated macrophages plays an important role in innate immune defences against *Mycobacterium tuberculosis* by acting in an autocrine fashion to inhibit the growth of virulent mycobacteria (Oddo et al., 2005). Low expression alleles of *MIF* were also shown to confer an increased risk of *M. tuberculosis* disease in some populations (Das et al., 2013). In the present study, we found that *MIF* expression was significantly upregulated during *T. b. gambiense* infections in both patients with active disease and individuals harbouring latent infections. *T. b. gambiense* thus seems to be a potent inducer of MIF in humans but MIF does not appear to control infection outcome, at least in the Guinean population. This is in contrast to a previous study in mice, where MIF expression was found to be increased in susceptible mice infected by *T. brucei*. In this model, MIF was proposed to be a major element promoting the most prominent pathological features of experimental trypanosomiasis (Stijlemans et al., 2014). Results presented here suggest that this may not be the case in our Guinean cohort. Interestingly other proinflammatory cytokines that are modulated by MIF, including IL8 and IL6, have been found to be significantly increased in individuals with latent infections (Gineau et al., 2016; Ilboudo et al., 2014). In contrast, susceptibility to disease was associated with increased levels of immunosuppressive molecules, such as IL-10 and soluble HLA-G (Gineau et al., 2016; Ilboudo et al., 2014). This suggest that the control of resistance/susceptibility to HAT occurs downstream of MIF activation in our study population.

This study has also identified four trans-acting eQTLs that are associated with the control of *MIF* expression. No signs of association were found at the *MIF* locus on chromosome 22, despite multiple cis-eQTL SNP being reported by the larger study undertaken by GTEx Consortium (GTEx Consortium, 2015). This could be due to the lower coverage of the H3Africa Illumina SNP chip in this region. It is noteworthy however that only suggestive genetic associations were observed between *MIF* polymorphisms and HAT in this Guinean population (Kabore et al., 2017). Another explanation is that *MIF* expression regulatory polymorphisms are too rare in this population for associations to be detected with our sample size. Importantly, most studies examining *MIF* regulation in infectious disease have focused on cis-regulatory elements (Rosado and Rodriguez-Sosa, 2011). Our study suggests that other loci in the genome may also play an important role and should be investigated further to better understand the mechanisms of *MIF* regulation and implication in disease exacerbation or infection control. The eQTL on chromosome 4 encompasses the *CXCL13* gene. Excessive CXCL13 production has been associated with the development of systemic lupus

erythematous nephritis and recombinant CXCL13 has been shown to induce the up-regulation of *MIF* expression in human podocytes *in vitro* (Worthmann et al., 2014). Interestingly two genes coding for RNA regulatory molecules, a small nucleolar RNA (*SNORD2*) and a micro RNA (*MIR3924*), were identified on chromosome 10 in this study, neither of these appeared to have any homology with sequences at the *MIF* locus suggesting that any regulatory effect that they might have on *MIF* is indirect through other genes. However, we only considered genes that either encompassed the significant SNP or were the closest gene when the SNP was located in an intergenic region. As shown with our imputed data (Fig 2), association signals can extend up to a 100kb on chromosomes 3, 4 and 10 suggesting that other candidate genes involved in *MIF* regulation may be located further away from the index SNP.

Furthermore, we found that the most significant eQTLs that may be involved in *MIF* expression regulation were obtained in analyses using infected individuals only (including HAT patients and individuals with latent infections) and excluding controls (Fig 3). This would suggest that *MIF* is actively regulated by trans-acting genes only when there is an inflammatory response, and that this trans-regulation dominates over any cis-regulation. At other times basal expression may be cis-regulated but our sample of 29 controls may have been too small to detect this or there may be no common regulatory variants at *MIF* in this population. This suggests that the *T. b. gambiense* infection has boosted the power to detect genetic loci controlling *MIF* expression. As potent inducers of immune responses, pathogens may thus serve as a valuable tool that may increase the power to unravel regulatory mechanisms involved in the control of critical mediators of immunity in human populations.

5. Conclusion

This study has shown that *T. b. gambiense* infection induces *MIF* expression in humans and has enabled us to locate four trans-acting eQTLs controlling *MIF* expression. As most pathogens are potent inducers of immunological molecules, such as MIF, our study demonstrates that combining clinical phenotypes, whole genome genotypes and expression data in infectious diseases, may contribute to improving our knowledge of immune regulation and susceptibility to other immune-pathophysiological diseases.

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514 **Figure legends**

515 **Fig 1: *MIF* expression in HAT patients, individuals carrying latent infections and endemic**
516 **controls.** (A) *MIF* expression levels according to the clinical status: endemic controls ($n = 46$),
517 HAT patients or cases ($n = 141$), latent infections ($n = 25$). (B) *MIF* expression levels in patient
518 before treatment ($n = 33$) and the same patient after treatment ($n = 33$). **** $p < 0.0001$, ** $p <$
519 0.01 , ns: not significant.

520 **Fig 2: Manhattan plots showing the locations of *MIF* expression eQTL.** The e-QTL analysis
521 was performed by linear regression using the clinical status (HAT patient, latent infection,
522 endemic control) as a covariate. A. eQTL mapping using the whole genome genotype dataset
523 from the Illumina 2.5M SNP chip. Association results after including imputed SNPs at the
524 candidate e-QTLs on chromosome 1 (B.), chromosome 3 (C.), chromosome 4 (D.) and
525 chromosome 10 (E.).

526 **Fig 3: Bar plot representing the mean p-value of significant imputed SNPs at each eQTL**
527 **locus according to the infection status.** For each model the phenotype was used as covariate
528 in the linear regression analysis. Covariate coding: 1-Infected versus Controls ($n = 172$):
529 Controls were coded 1 and both active and latent infections were coded 2; 2- HAT cases versus
530 Controls ($n = 157$): Controls and active cases were coded 1 and 2 and latent infections were
531 coded 0 (missing) and were excluded; 3-HAT cases versus Latent ($n = 143$): Latent infections
532 were coded 1, active cases were coded 2, controls were coded 0 and were excluded.

533

534 **Table 1: Analysis of *MIF* expression levels according to recorded covariates**

Covariates			Univariate	Multivariate
	<i>n</i>	<i>MIF</i> ^a	<i>p</i>	<i>p</i>
<i>Sex</i>				
Females	88	1.22 ± 0.10	0.3121	0.2250
Males	124	1.16 ± 0.07		
<i>Age</i>				
≤ 24 years	68	1.15 ± 0.10	0.2866	0.2614
25 – 39 years	77	1.21 ± 0.11		
≥ 40 years	67	1.19 ± 0.09		
<i>Disease focus</i>				
Forecariah	61	1.22 ± 0.13	0.0951	0.0395*
Dubreka	106	1.20 ± 0.71		
Boffa	45	1.27 ± 0.13		
<i>HAT phenotypes</i>				
Controls	46	0.94 ± 0.11	<0.0001	<0.0001***
Latent infections	25	1.23 ± 0.13		
HAT	141	1.25 ± 0.07		

535 ^a Mean fold change ± mean confidence interval

536 **Table 2: SNPs reaching genome wide significance in the *MIF* e-QTL analysis.**

<i>CHR</i>	<i>SNP</i>	<i>BP</i>	<i>A1</i>	<i>TEST</i>	<i>NMISS</i>	<i>BETA</i>	<i>STAT</i>	<i>P</i>
1	kgp15347739	116918691	G	ADD	120	0.5036	5.937	3.04E-08
3	snp-known116300863	115325154	A	ADD	149	0.4603	5.642	8.44E-08
4	kgp20876446	78506066	G	ADD	120	0.5356	5.754	7.12E-08
10	snp-known78014716	58884536	C	ADD	120	0.5346	5.696	9.29E-08

537 CHR: Chromosomes, SNP: single nucleotide polymorphism, A1: minor allele name, BP, base-pair physical
538 position, ADD: additive model. The e-QTL analysis was performed on the whole data set (n=172) using a linear
539 regression model with the clinical status as a covariate.

540 **Table 3: Proximal e-QTLs candidate genes controlling *MIF* expression.**

<i>CHR</i>	<i>SNP</i>	<i>Gene name</i>	<i>Gene stable ID</i>	<i>Gene description</i>
1	kgp15347739	AL136376.1	ENSG00000269279.1	Uncharacterized protein
3	snp-known116300863	RP11-190P13.1	ENSG00000244157.1	eukaryotic translation initiation factor 4E family member 2 pseudogene 2
3	snp-known116300863	GAP43	ENSG00000172020.8	growth associated protein 43
4	kgp20876446	CXCL13	ENSG00000156234.7	chemokine (C-X-C motif) ligand 13
10	snp-known78014716	SNORD2	ENSG00000238707.1	Small nucleolar RNA SNORD2
10	snp-known78014716	MIR3924	ENSG00000264747.1	microRNA 3924

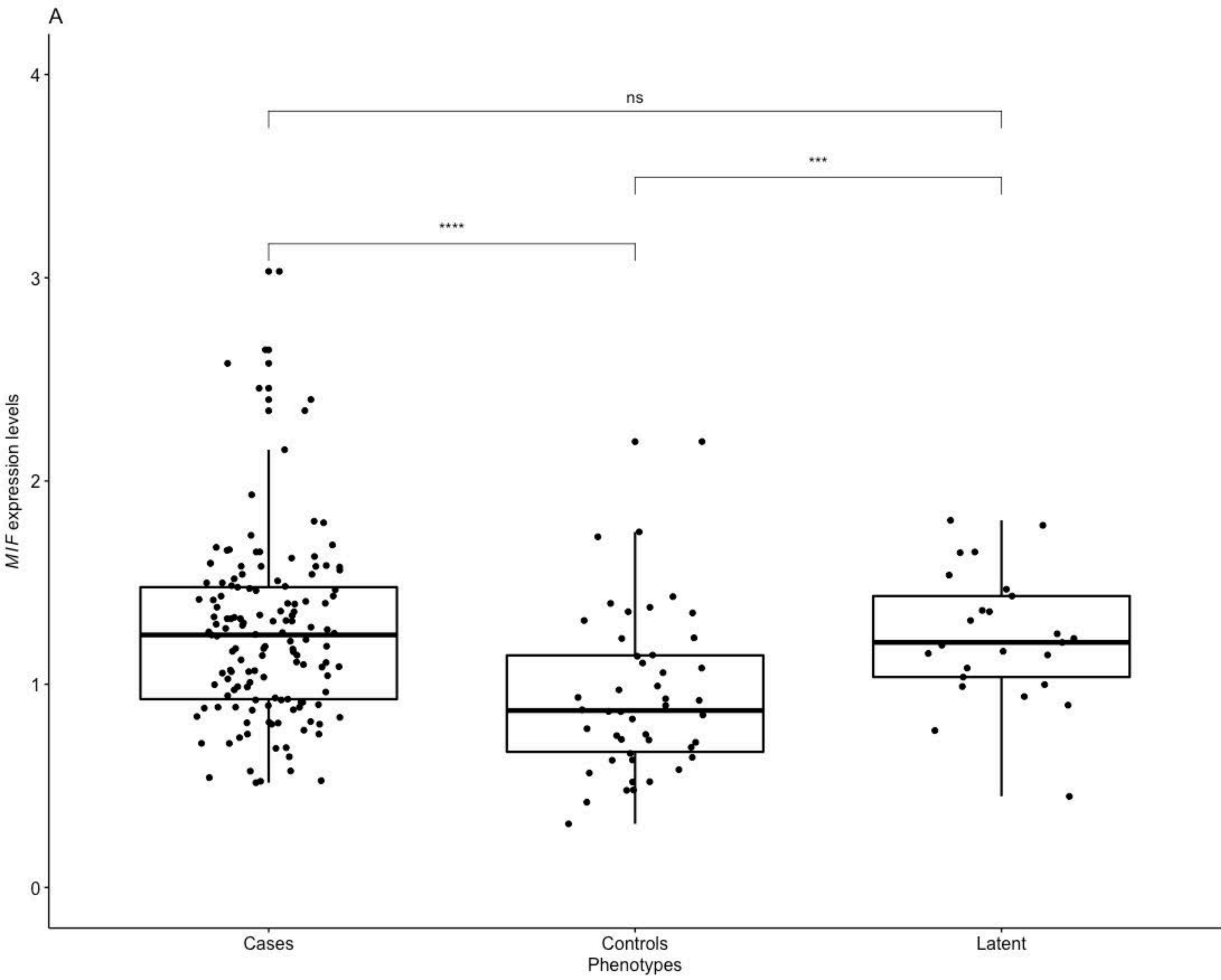
541 CHR: Chromosomes, SNP: single nucleotide polymorphism. Each SNP reaching genome wide association
542 significance was annotated with either the gene they were located in or the genes immediately upstream or
543 downstream for intergenic SNPs.

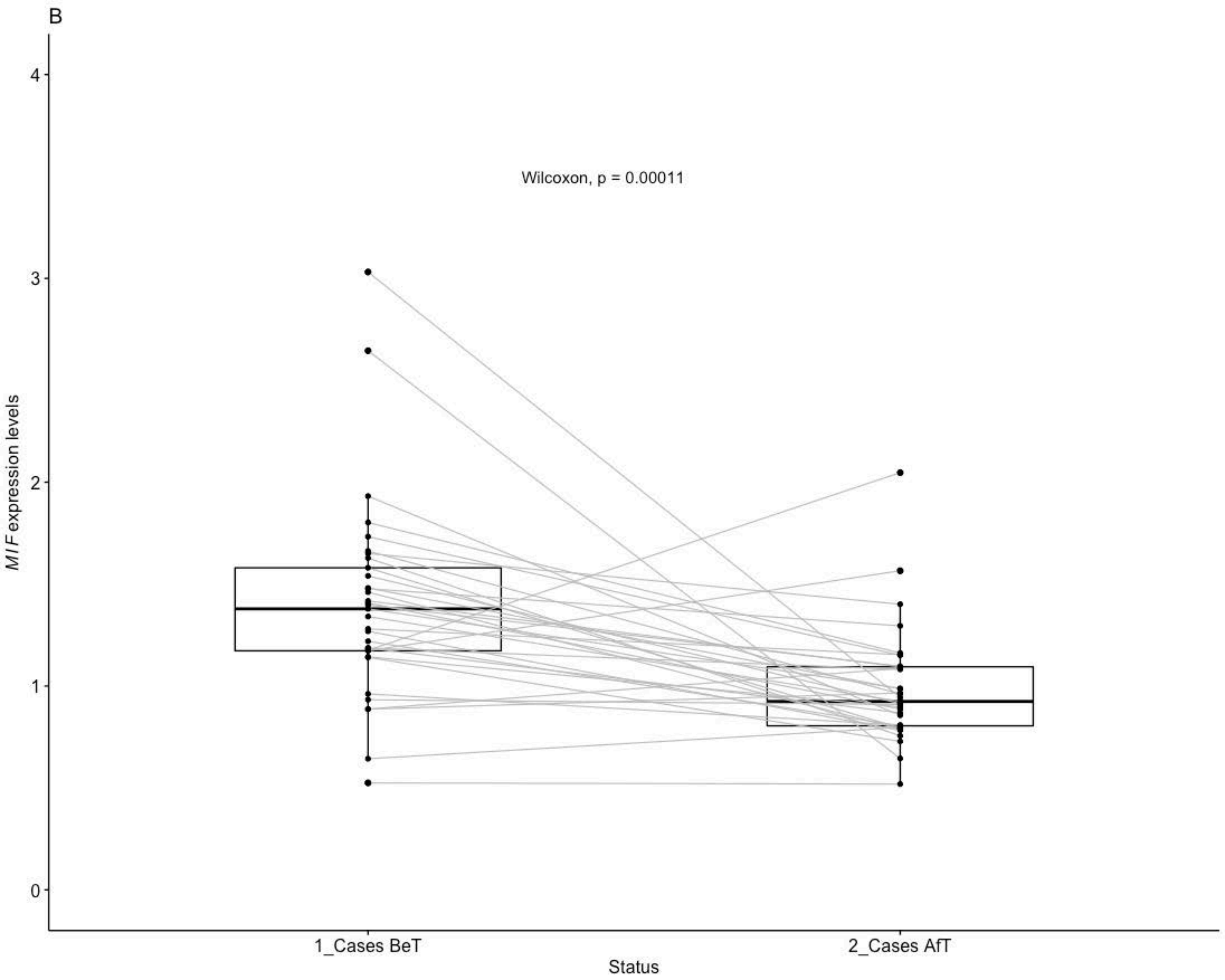
544 **Supporting Information Legends**

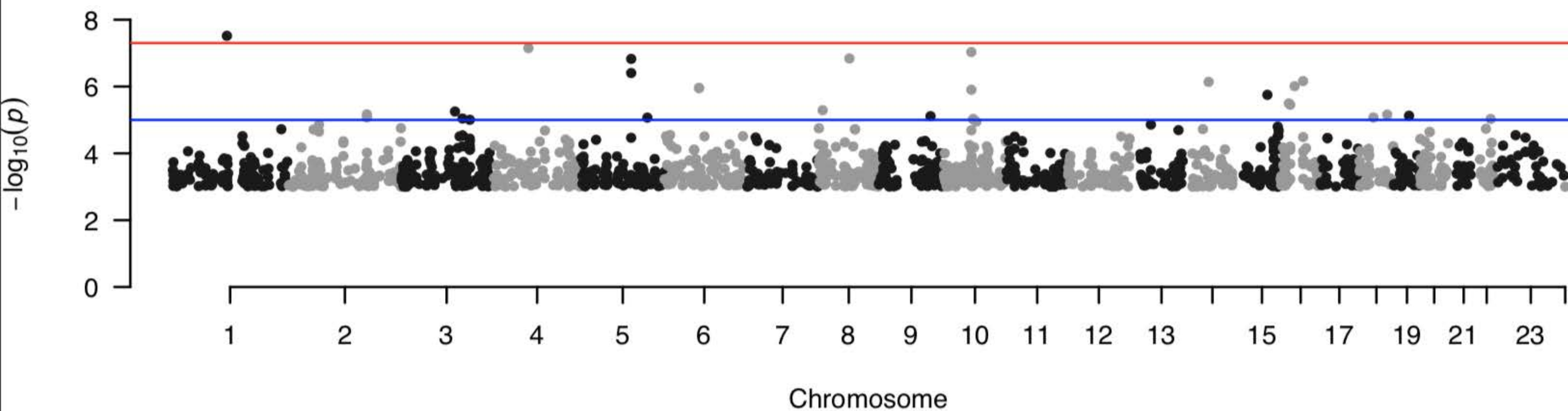
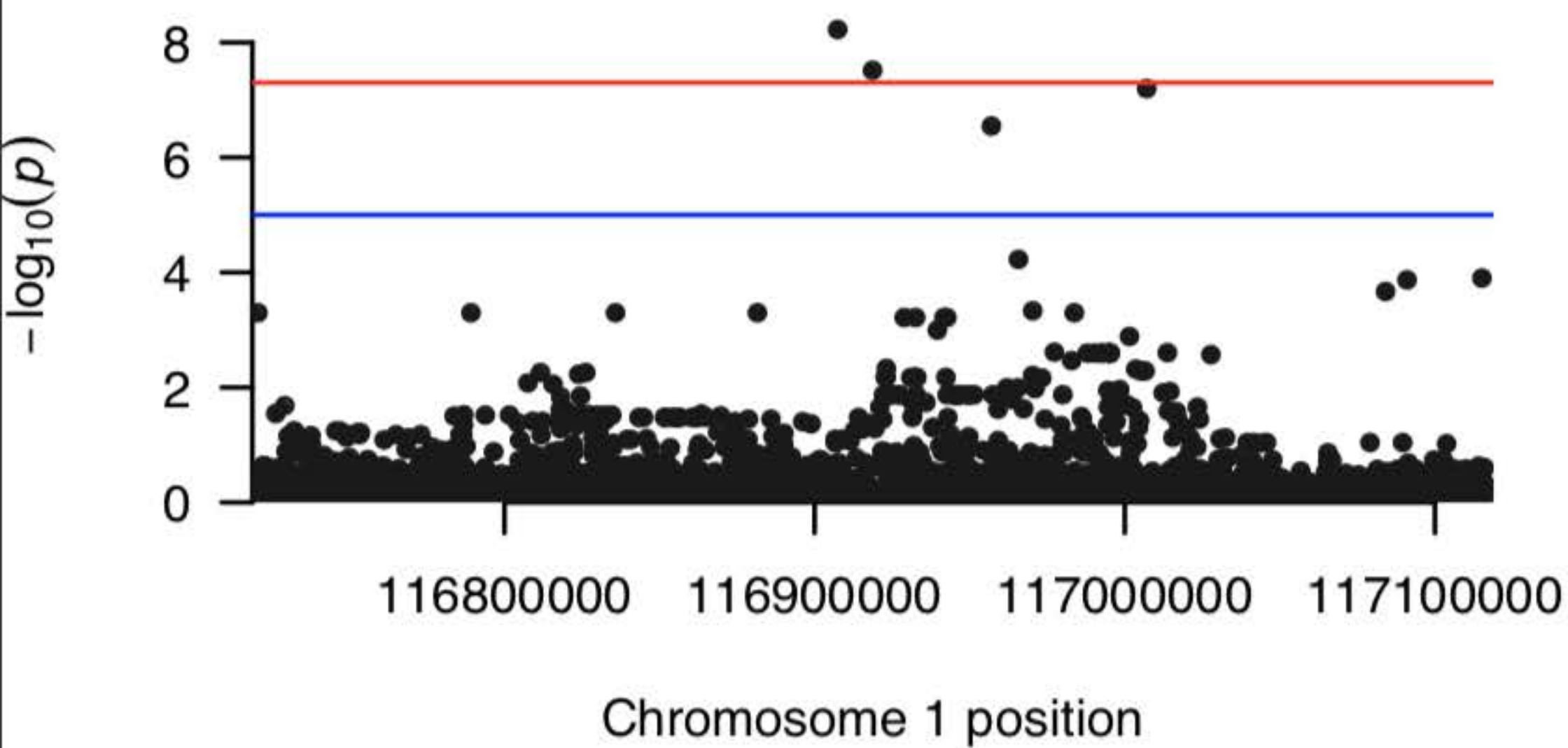
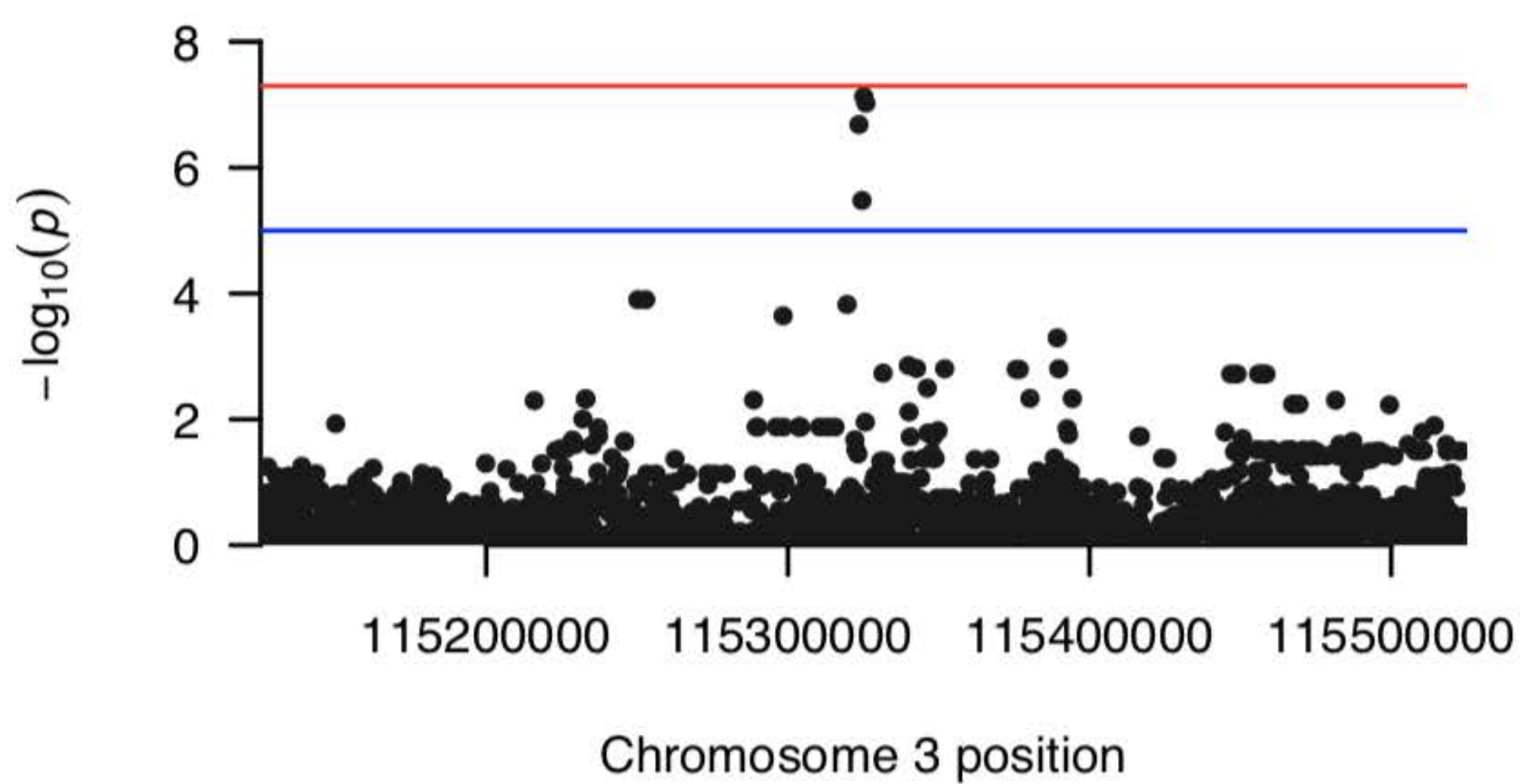
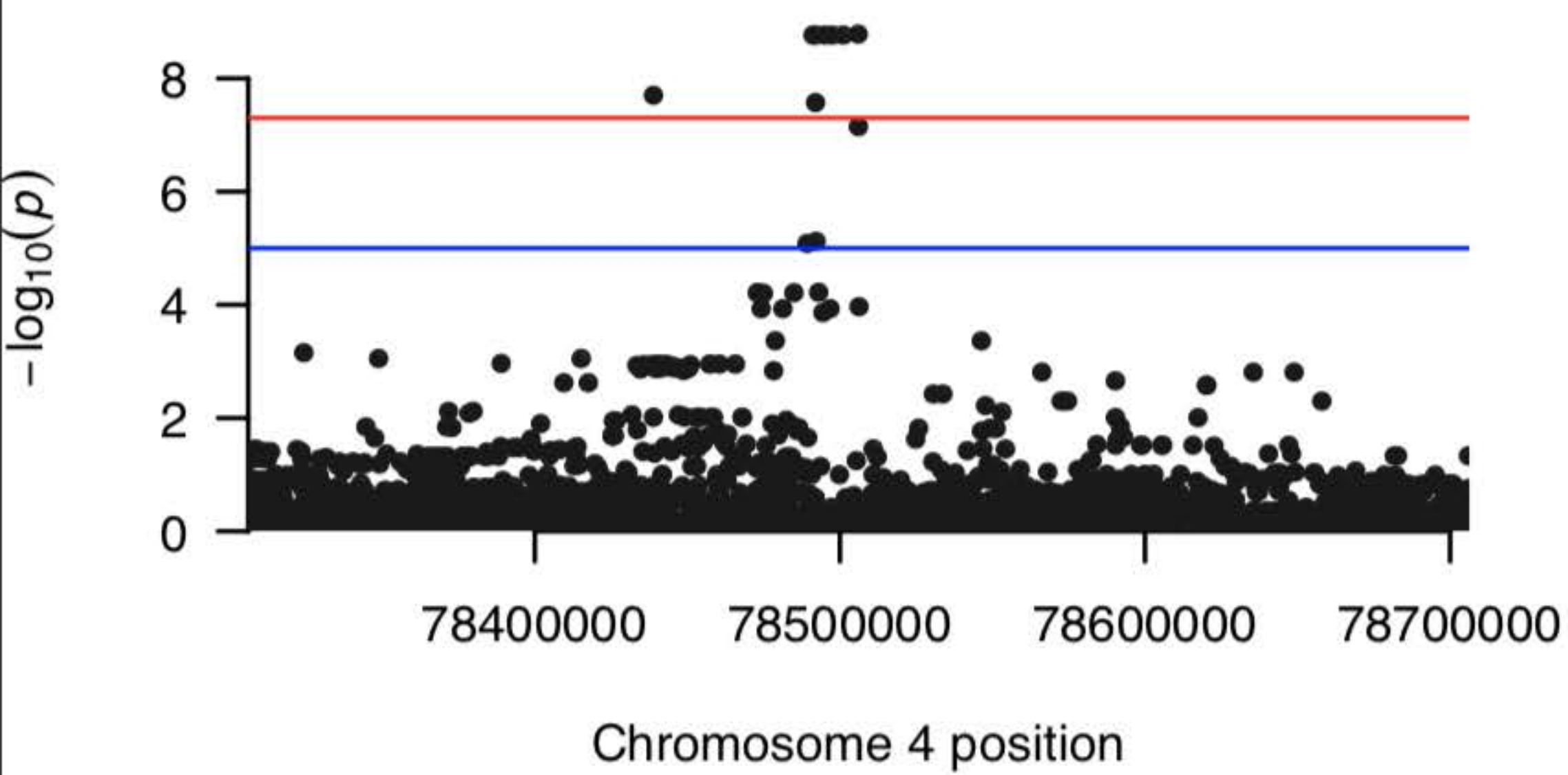
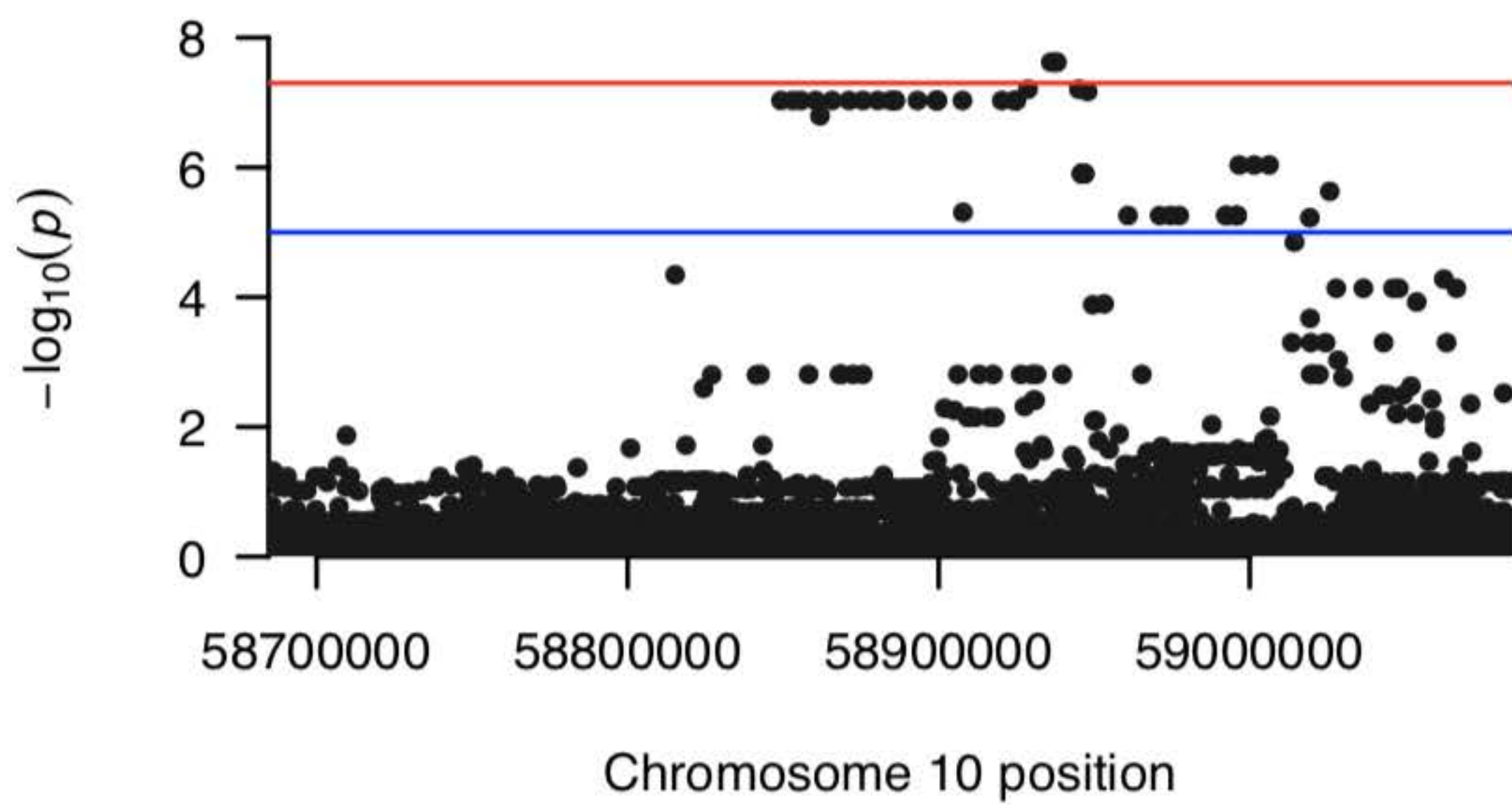
545 **Table S1: The age and gender characteristics of the different study phenotype groups**

546 **Table S2: *MIF* Expression levels according to the HAT clinical status**

547 **Table S3: SNPs reaching genome wide significance in the *MIF* e-QTL analysis with**
548 **imputed data.**





A**B****C****D****E**

mean p value

- Infected vs Controls
- HAT cases vs Controls
- HAT cases vs Latent

